

Ecology of the rare microbial biosphere of the Arctic Ocean

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Understanding the role of microbes in the oceans has focused on taxa that occur in high abundance; yet most of the marine microbial diversity is largely determined by a long tail of low-abundance taxa. This rare biosphere may have a cosmopolitan distribution because of high dispersal and low loss rates, and possibly represents a source of phylotypes that become abundant when environmental conditions change. However, the true ecological role of rare marine microorganisms is still not known. Here, we use pyrosequencing to describe the structure and composition of the rare biosphere and to test whether it represents cosmopolitan taxa or whether, similar to abundant phylotypes, the rare community has a biogeography. Our examination of 740,353 16S rRNA gene sequences from 32 bacterial and archaeal communities from various locations of the Arctic Ocean showed that rare phylotypes did not have a cosmopolitan distribution but, rather, followed patterns similar to those of the most abundant members of the community and of the entire community. The abundance distributions of rare and abundant phylotypes were different, following a log-series and log-normal model, respectively, and the taxonomic composition of the rare biosphere was similar to the composition of the abundant phylotypes. We conclude that the rare biosphere has a biogeography and that its tremendous diversity is most likely subjected to ecological processes such as selection, speciation, and extinction.

abundance distribution | bacteria | archaea | pyrosequencing | biogeography

Marine microbes are essential for the functioning of marine ecosystems (1), yet the extent of their diversity remains unclear (2). The early approach of direct cultivation to identify marine microbes gave very low estimates of diversity and abundance. The development and in situ application of molecular tools greatly changed our perception of microbial diversity, revealing that only a very small fraction of microorganisms were detected by culture (3). These cultivation-independent approaches showed that microbes represent the main diversity of life on earth (4). In marine systems, the diversity of microbes seems to increase with increasing sampling effort and resolving power of new molecular tools. Initially the diversity of marine bacteria was predicted to be as low as a few thousand taxa (5); more recent estimates have raised the number to 10^6 – 10^9 taxa (2). The diversity of archaea, in turn, appears generally to be much lower than for bacteria (6), and marine archaea could be 5–10 times less diverse than bacteria (7, 8).

The main focus of marine molecular microbial studies has been on the most abundant members of the communities for practical reasons; the abundant phylotypes are the easiest to detect with the most widely used molecular tools. PCR-based fingerprinting and cloning techniques using universal primers most easily amplify microbes with abundances in the ecosystem of $>1\%$ of the total community (2, 9). The most abundant taxa are also thought to be the most active and most important in fluxes of dissolved organic matter (10). However, abundant species represent only a small portion of microbial diversity. Analyses of abundance distribution indicate that diversity is divided into two main components. One component includes the few species that are very abundant, which

is the most studied part of the community. The other component, named “the rare biosphere” (11), comprises a very high number of rare species that contains most of the diversity (2). The presence of this long tail of rare microbes was first demonstrated by targeted pyrosequencing of marine bacteria in the deep Atlantic (11), then in deep oceanic vents (8) and in the Arctic Ocean both for bacteria (12, 13) and archaea (7).

As accumulating data confirm the prevalence of the rare biosphere, we still know little about its ecological and functional role in the ocean. The main hypothesis proposes that the rare members of the biosphere have a cosmopolitan distribution because of a low loss rate by viral lysis or predation, combined with potentially unlimited dispersal capacity governed by stochastic immigration (2). The goal of this study was thus to test whether the rare biosphere represents cosmopolitan taxa or whether, similar to abundant phylotypes, the rare community has a biogeography structured by ecological processes such as selection and speciation. We used data from 16S rRNA gene pyrosequencing analysis of 24 bacterial and eight archaeal samples from across the Arctic Ocean to compare the similarity among rare members of the communities. We furthermore applied models for abundance distribution and described the taxonomic composition of both rare and abundant phylotypes.

Results

Similarity Among Communities. We assessed the community similarity among sites by comparing the relative abundance and distribution of 545,246 bacterial and 195,107 archaeal V6 tag 16S rRNA gene sequences (Table S1). We separated the microbial phylotypes (defined in *Materials and Methods*) as abundant or rare. Rare phylotypes were arbitrarily defined as having a frequency $<0.01\%$ and abundant phylotypes a frequency $>1\%$ within a sample. Our data showed that the grouping for the rare bacterial phylotypes was similar to the clustering of the abundant phylotypes, which in turn was similar to the clustering of the entire community (Fig. 1). Archaeal communities gave the same result (Fig. 1). Cluster analysis separated the communities into two main groups. One group contained all communities from surface waters (samples ACB, Fig. 1), and the other group contained all deep water mass communities (samples DAO). Deep communities were further separated into two clusters. One cluster contained communities from the Eurasian Basin (colored red in Fig. 1), and the other cluster contained communities from the Canada Basin (blue) of the Arctic Ocean. Surface samples separated into three groups. The first group comprised samples collected mostly in winter with three from January, but with one sample from July (cluster colored black, Fig. 1). The second contained only summer samples collected in

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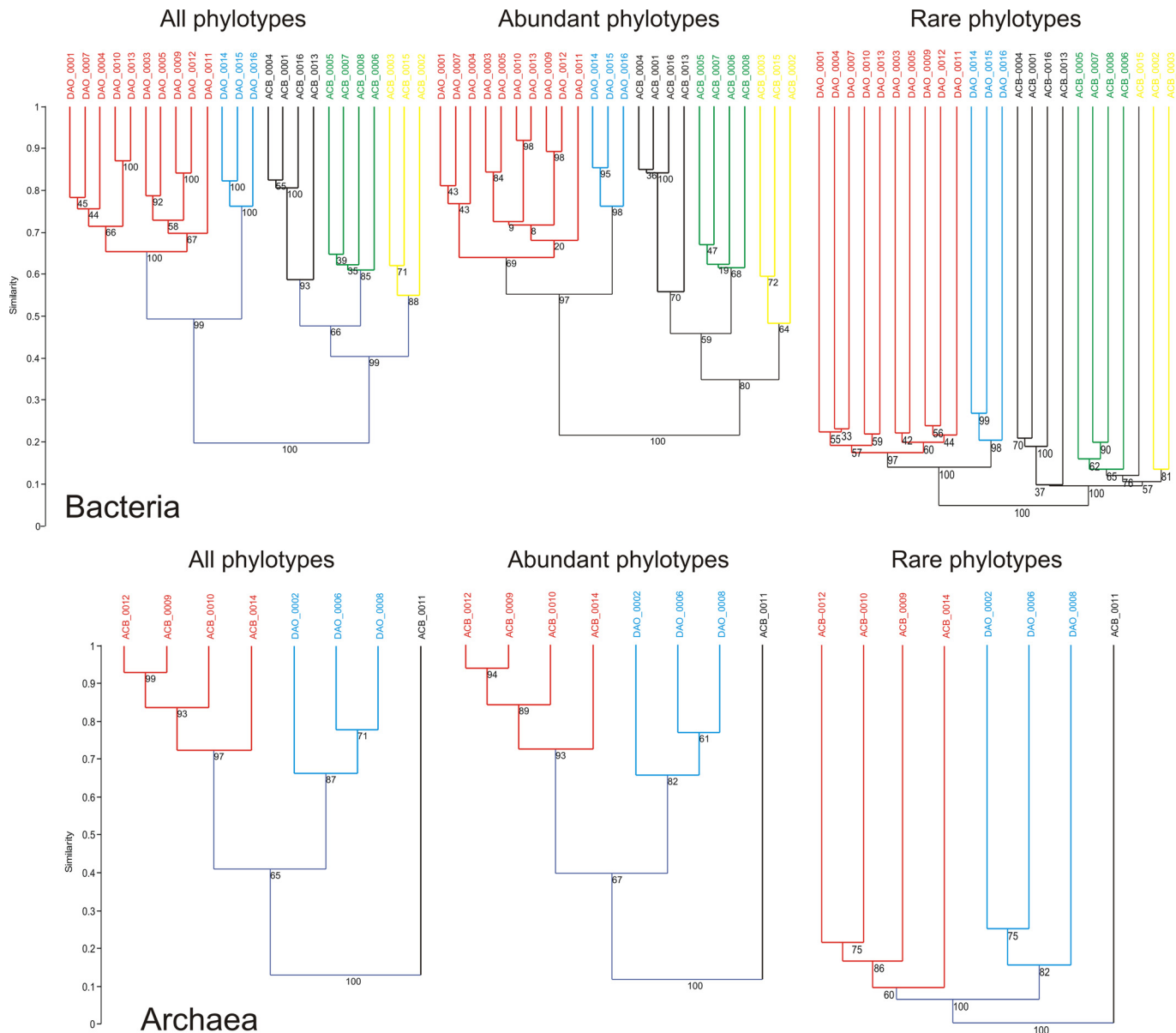


Fig. 1. Dendrograms representing the similarity between the composition of 24 bacterial and eight archaeal communities from deep (DAO) and surface (ACB) water masses of the Arctic Ocean. The clustering pattern including all phylotypes is compared with the clustering obtained for abundant phylotypes only (frequency >1%) and for rare phylotypes only (<0.01%). Colors highlight the clusters conserved through the three analyses. Clustering is based on a distance matrix computed with Bray–Curtis similarity. The dendrogram was inferred with the unweighted pair-group average algorithm. Bootstraps values (in percentages) are given at the nodes.

July and August (cluster in green) and the third cluster contained two July and one January sample (cluster in yellow). Archaea separated into three main groups. One contained all surface samples (red, Fig. 1), the other all deep water samples (blue), and the third only one sample (black). This grouping was similar for the abundant and rare samples (the single exception being sample ACB.0015).

When phylotypes were defined more stringently (100% identity), the community grouping was still similar between rare and abundant phylotypes for both bacteria and archaea (Fig. S1). The patterns of biogeography were still present for rare phylotype with a frequency $<0.001\%$ (Fig. S2). Such a low frequency could be detected only when sequences from all samples were grouped together. This was the lowest threshold that we could apply to define rare phylotype.

Nonmetric multidimensional scaling analysis showed that the

rare phylotypes better separated ACB samples (surface) from DAO samples (deep waters) than the abundant phylotypes did (Fig. 2). This analysis also revealed that the difference in community composition was greater between rare and abundant phylotypes than between surface and deep samples. The result was the same when the more stringent definition (100%) of a phylotype was used (Fig. S3).

Rare and Abundant Phylotypes. There was a clear difference between the abundance distributions of the rare and abundant phylotypes (Fig. 3). The rare phylotypes followed a log-series distribution, whereas the abundant phylotypes followed a log-normal distribution albeit poorly. This difference in the abundance distribution was observed for both bacteria and archaea (Fig. 3). A similar separation between the abundance distribution of rare and abundant phylotypes was found for ACB (surface) and DAO samples (deep waters) (Fig. S4).

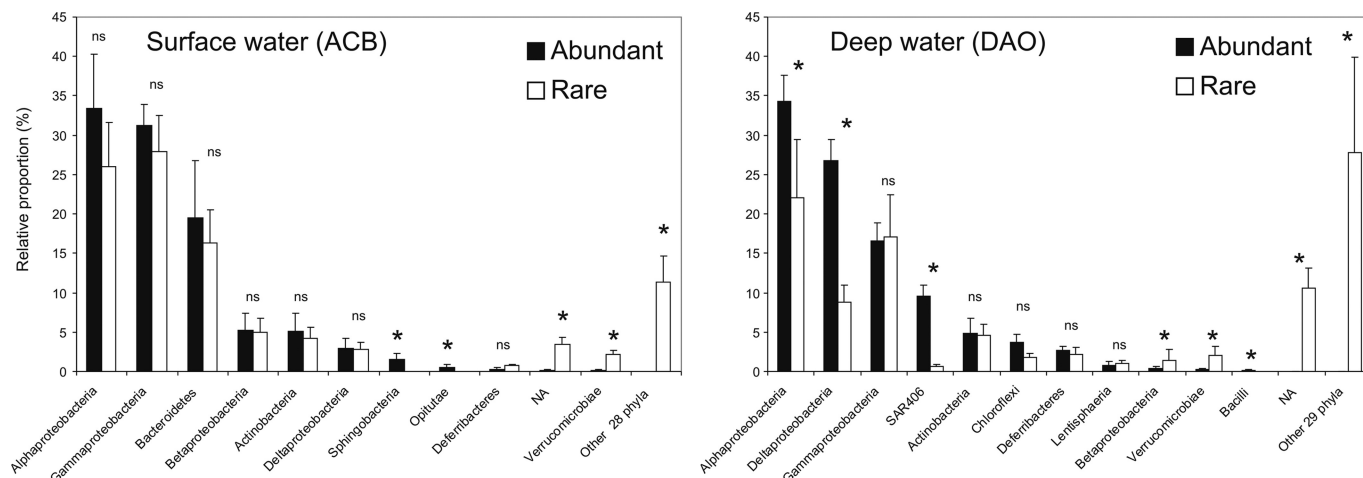


Fig. 5. Phylogenetic composition of abundant phylotypes (>1% frequency) compared with rare bacterial phylotypes (<0.01%) in surface (ACB) and deep (DAO) water masses of the Arctic Ocean. NA, not assigned; ns, not significant. *, $P < 0.05$ (t test results for difference between rare and abundant phylotypes).

sphere has a cosmopolitan distribution governed by stochastic immigration. The cosmopolitan theory proposes that rare phylotypes are recruited through immigration (dispersal) and that they are protected from active loss by both viral lysis and predation because of their low abundance. Consequently, if all microbes are easily and globally dispersed, the rare biosphere would be ubiquitously distributed, and all rare phylotypes would be found everywhere (2). Our results, demonstrating patterns of biogeography for the rare biosphere, clearly show that the dictum “everything is everywhere” does not apply here. It therefore suggests that one or both postulates for the cosmopolitan theory are not valid: Marine microorganisms are not as easily dispersed as previously thought, and so barriers for dispersal exist, and/or the rates of active losses (predation or viral lysis) on the rare biosphere are significant.

An important ecological aspect for understanding biogeography is to determine how patterns of diversity are shaped by the relative influence of allopatric vs. sympatric speciation models. Sympatry will occur under a strong influence of contemporary environmental factors, and microbial diversity would be shaped by the presence of multiple habitats, corresponding to different environmental conditions, within one province (14). The biogeography of bacterial and archaeal diversity has recently been associated with water masses (12, 15, 16), and each water mass could represent a specific habitat within the same province represented by an ocean. Differences in community composition would thus reflect the differences in environmental conditions existing among water masses as proposed for planktonic foraminifers (17, 18). On the other hand, allopatric speciation shaped by the influence of historical events has also been shown for marine plankton (19). A historical isolation of communities and lack of biological dispersal would imply the presence of multiple provinces but one habitat only (14). The density difference between water masses creates strong physical boundaries that can limit the dispersion of microbes because of their small size and planktonic lifestyle. In that context, within the same marine habitat, water masses physically isolated from each other over time would represent different provinces. The present composition of marine microbial community, as for macroorganisms, probably reflects the influences of both historical and contemporary environmental conditions.

The intrinsic multidimensional and dynamic characteristics of the ocean complicate the test of classical ecological models such as the taxa–area or the distance–decay relationship recently applied to microorganisms (20, 21). For instance, in our study, distance was much less important than water mass for explaining differences in community composition. Communities originating from the same

water mass but separated by thousand kilometers (e.g., DAO.0003 and DAO.0005 or DAO.0004 and DAO.0007) were much more similar to each other than communities only separated by a few 100 m (e.g., DAO.0003 and DAO.0004) but originating from different water mass. Thus, the concept of spatial scale that has been applied to microorganisms in soils (22), springs (23), or lakes (24) cannot be directly transposed to marine ecosystems where water masses with motion have to be considered.

Our results indicate that the vast majority of the rare phylotypes (99%) were always rare, i.e., never detected as abundant in any of the samples analyzed. Those samples comprised contrasting environmental conditions such as winter and summer, or surface and deep water masses. If rare phylotypes were acting as a source (seed bank), they would be expected to be rare under certain environments and abundant when conditions become adequate. For example, rare deep water phylotypes could become abundant if brought up to the surface. Similarly, a phylotype rare in winter could bloom during summer and become abundant. However, Kirchman et al. (13) recently reported that phylotypes that were rare in winter in surface waters of the Arctic Ocean did not become abundant during summer. Likewise, our results indicate that rare phylotypes remained rare when surface samples were compared with deep water samples. For macroorganisms, data also suggest that species retain their basic status as common or rare up to one million years (25). We therefore hypothesize that regardless of spatial or temporal scales most of the rare phylotypes are always rare within an ecosystem. Under that hypothesis, the few rare phylotypes that are sometimes detected as abundant represent traces of phylotypes that are highly abundant in some habitats (here water masses). A very high abundance implies a probable higher dispersion rate, resulting in abundant phylotypes being present (as rare) in many different habitats. This was illustrated by the higher proportion of phylotypes that were abundant and never rare in deep water (35% of abundant sequences) than in surface waters (19%). Abundant surface phylotypes have higher probability of sinking and be rare at depth than deep water phylotypes have to reach the surface.

The phylogenetic composition of the rare biosphere was similar to the composition of the abundant members of the community. The abundant taxonomic groups are thought to be well adapted to their environment and to contribute the most to biomass production (10, 26). However, some rare species are important for global biogeochemical cycling. Nitrogen fixation in the open ocean, for example, is mediated by rare members of the microbial community (27). However, the similarity between the phylogeny of rare and

all analysis throughout our study. For comparison we also used a much more stringent definition in which sequences with 100% identity were grouped as belonging to the same phylotype. We called this the "100% identity" phylotype definition.

To estimate community similarity among samples we applied a hierarchical cluster analysis on the basis of the abundance of phylotypes in the communities using Bray–Curtis similarity and a dendrogram inferred with the unweighted pair–group average algorithm. To determine the robustness of the clustering, data were subjected to bootstrapping with 1,000 resampling and the analysis was rerun after removing the largest and the smallest samples. The difference in phylotype composition was examined by nonmetric multidimensional scaling analysis. The analysis was based on the relative abundance of the phylotypes within each sample and calculated as Bray–Curtis similarity. Analysis of similarity statistics were used to verify the significance of the dendrogram clustering by testing the hypothesis that bacterial communities from the same cluster were more similar in composition with each other than with communities in different clusters. A Bray–Curtis similarity matrix computed from the abundance of phylotypes was used to generate one-way analysis of similarity statistics with 10,000 permutations.

Abundance distributions were plotted following power-of-2 abundance

classes (octave classes) and then fit to abundance models. The log-normal and log-series fitting algorithms (43) were applied to each dataset and a significance value was calculated based on a χ^2 test. The model with $p \neq 0$ was chosen as the one best fitting the abundance distribution.

All statistical and diversity analyses were conducted with the program PAST, version 1.91 (44).

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